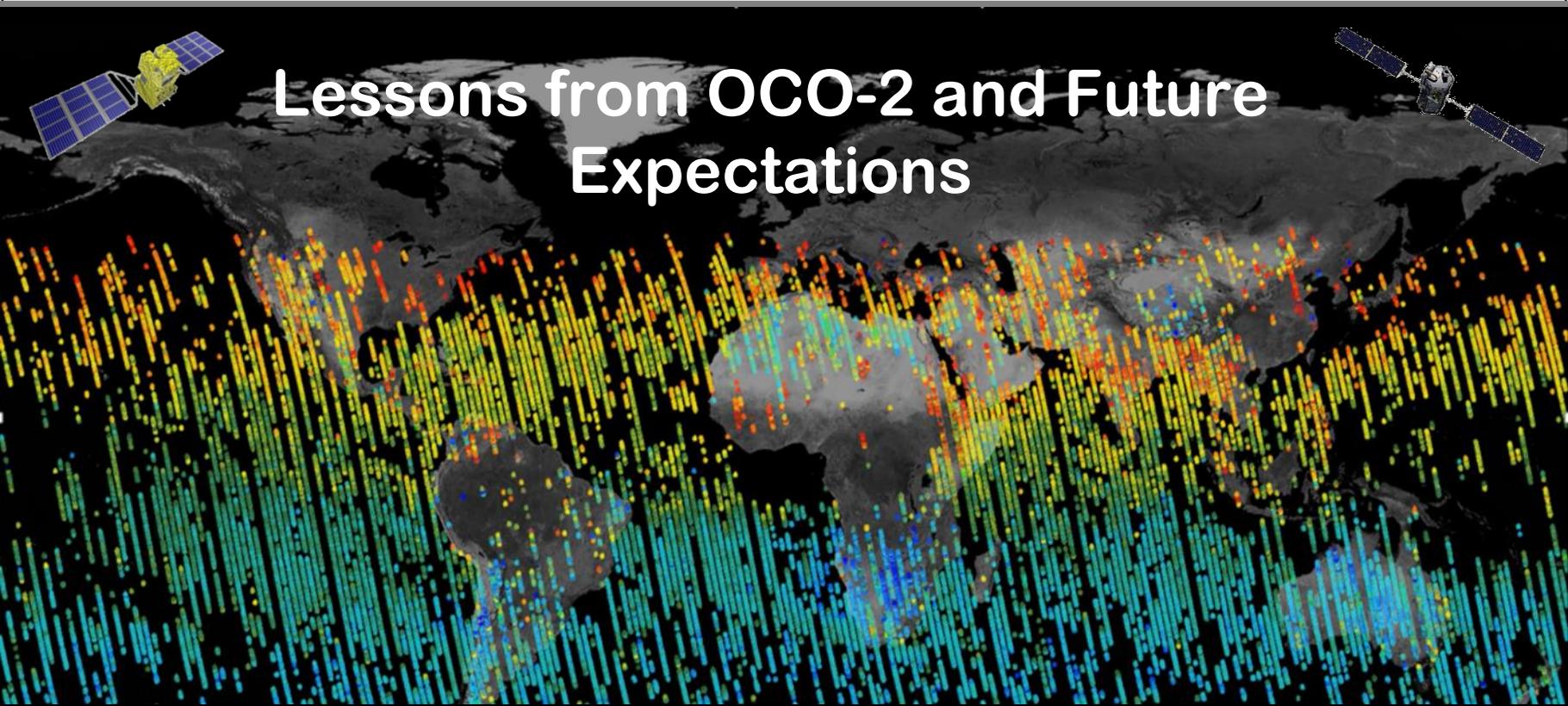




# The International Workshop on Next Generation CO<sub>2</sub> Monitoring Satellite

## Lessons from OCO-2 and Future Expectations



**Hartmut Boesch for  
David Crisp, Jet Propulsion Laboratory, California Institute of Technology**

**1-3 November 2017**



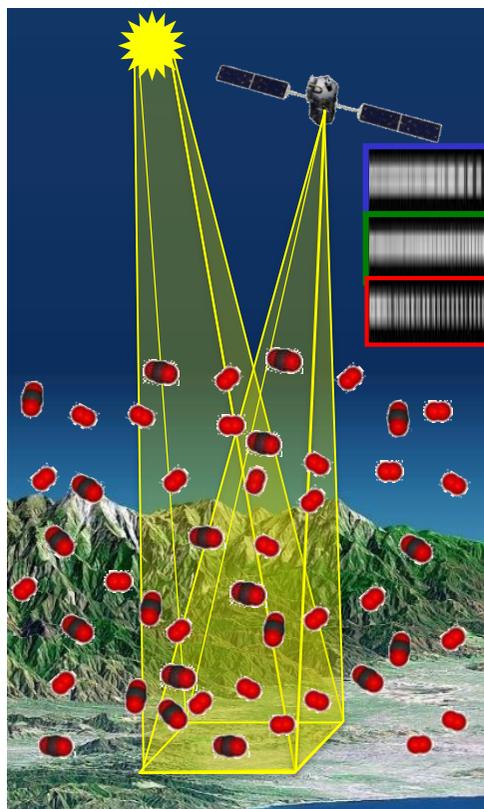
# Lessons Learned from OCO-2

- High accuracy and low bias are both essential
- High spatial resolution (footprint area  $< 4 \text{ km}^2$ ) critical for
  - Quantifying emissions from compact sources
    - $X_{\text{CO}_2}$  anomaly associated with a given  $\text{CO}_2$  injection is inversely proportional to the area of the footprint
  - Gathering full-column data in presence of patchy clouds
- Coverage: Imaging rather than sampling the  $\text{CO}_2$  field
  - Critical for tracking emission plumes and resolving anthropogenic emission sources from the natural background
- Proxies (SIF, CO, and  $\text{NO}_2$ ) may be needed for attribution
- Improved remote sensing retrieval algorithms and carbon flux inversion models are critical for exploiting the information from space based greenhouse gas measurements

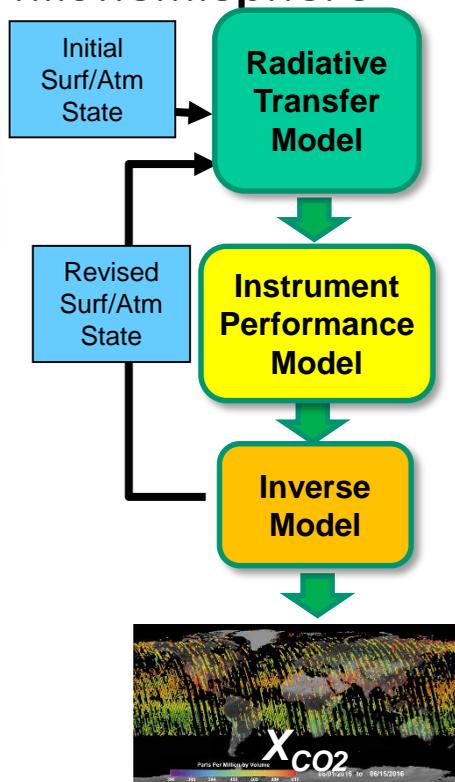


# Measuring CO<sub>2</sub> from Space

- Record spectra of CO<sub>2</sub> and O<sub>2</sub> absorption in reflected sunlight



Retrieve variations in the **column averaged CO<sub>2</sub> dry air mole fraction, X<sub>CO2</sub>** over the sunlit hemisphere



Validate measurements to ensure X<sub>CO2</sub> accuracy of 1 ppm (0.25%)

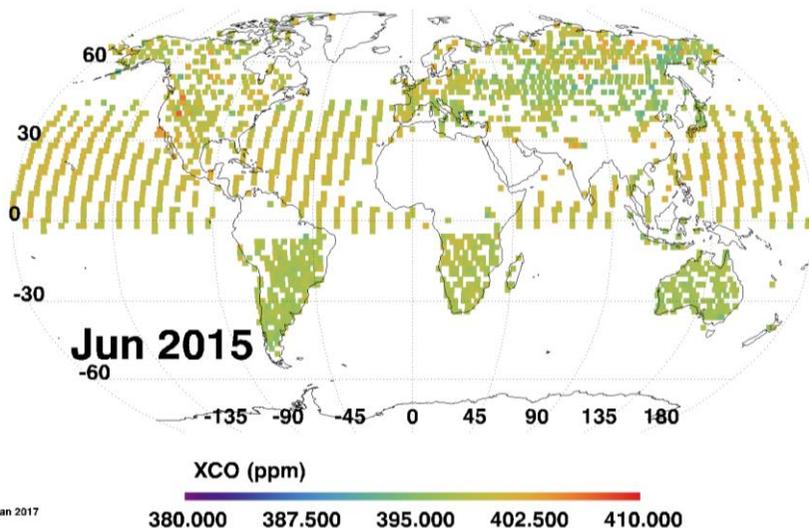




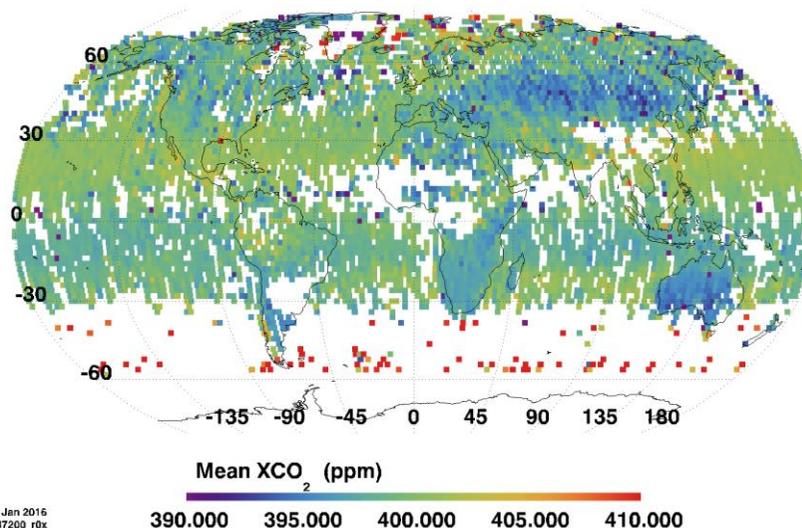
# Retrieving $X_{CO_2}$ from GOSAT and OCO-2 Data



## GOSAT



## OCO-2



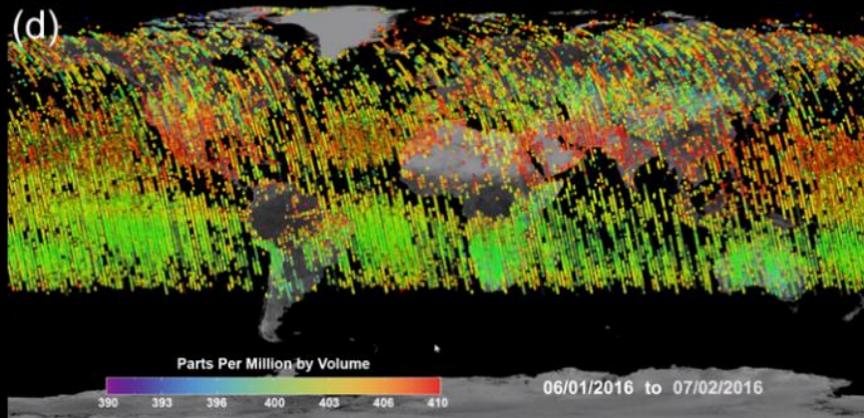
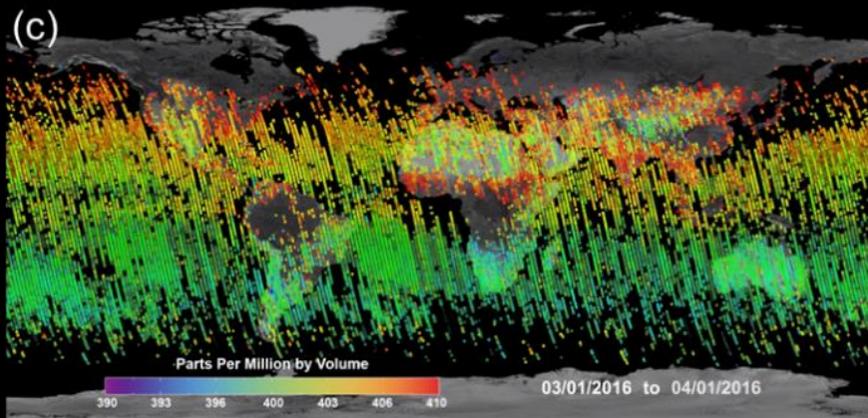
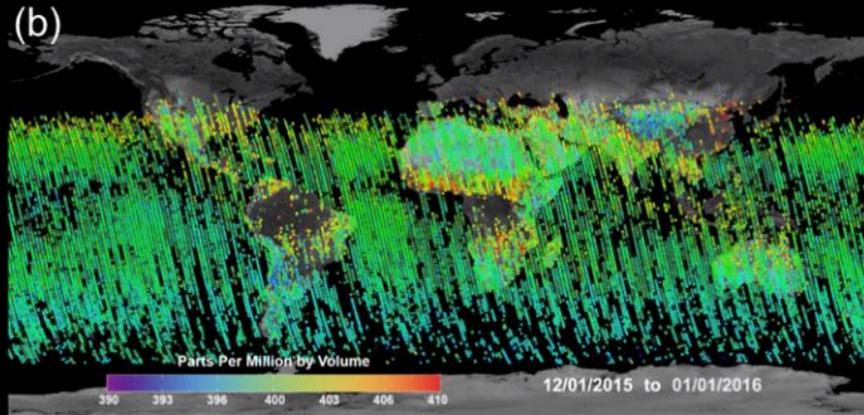
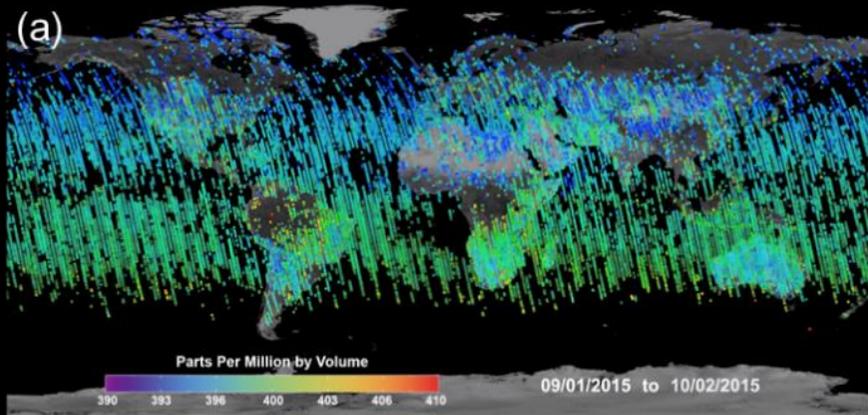
GOSAT TANSO-FTS has been returning 300-100 cloud free soundings/day since Apr 2009. The ACOS/GOSAT team has been using these data to retrieve  $X_{CO_2}$ .

OCO-2 has been returning 25000 to 70000 soundings/day since Sept 2014. The ACOS/GOSAT algorithm was modified to retrieve  $X_{CO_2}$  from these data.





# OCO-2 Coverage (B7 Product)





# Cross-Calibration and Cross-Validation Essential to Combine Data Products



## Vicarious Calibration

MODIS BRF

Zenith Angle

Azimuth Angle

L04, M08, L08, M20, H14

Solar panels

EM27/SUN and its housing

AMES AJAX

LSPEC

AERONET

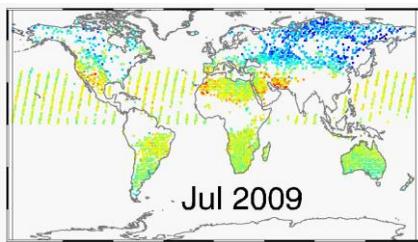
## Retrieval Algorithm

Forward Radiative Transfer Model  
Spectra + Jacobians

Instrument Model Spectral+Polarization

Inverse Model

- Compare obs. & simulated spectra
- Update State Vector



## Cross Validation

World map of GOSAT sites

Scatter plot: GOSAT  $X_{CO_2}$  (ppm) vs TCCON  $X_{CO_2}$  (ppm)

Scatter plot: OCO-2  $X_{CO_2}$  (ppm) vs TCCON  $X_{CO_2}$  (ppm)

ACOS GOSAT B7.3

GOSAT-ACOS B7.3

OCO2 v7B

OCO-2 v7

not converged  
?  
converged

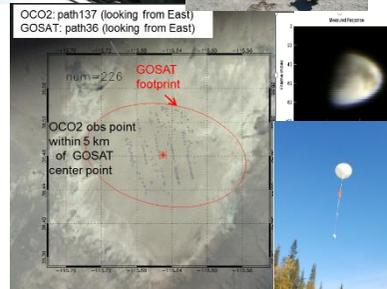




# Creating a Combined Data Product: Cross-Calibration and Cross Validation

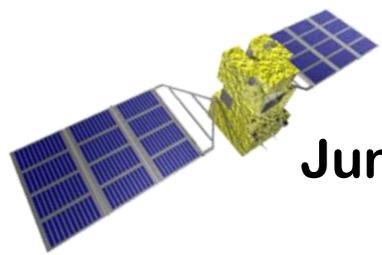


- Pre Launch:
  - Exchange information on best practice for pre-launch instrument characterization
  - Cross calibration of pre-launch radiometric standards
  - Exchange of gas absorption coefficient and solar data
  - Retrieval algorithm development/intercomparison
  - Validation system development (TCCON, aircraft)
  - Multi-Satellite OSSE's – what do you gain with truly coordinated observations
- Post Launch:
  - Cross calibration of solar/lunar/Earth(vicarious: RRV+?) observations
  - Including exchange of solar and lunar standards
  - Cross validation: TCCON, EM27/Sun, and aircraft validation campaigns
  - Continued retrieval algorithm development/intercomparisons

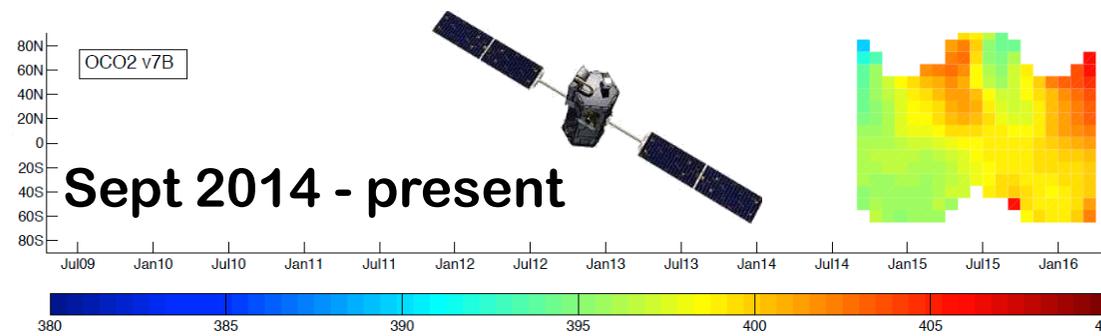
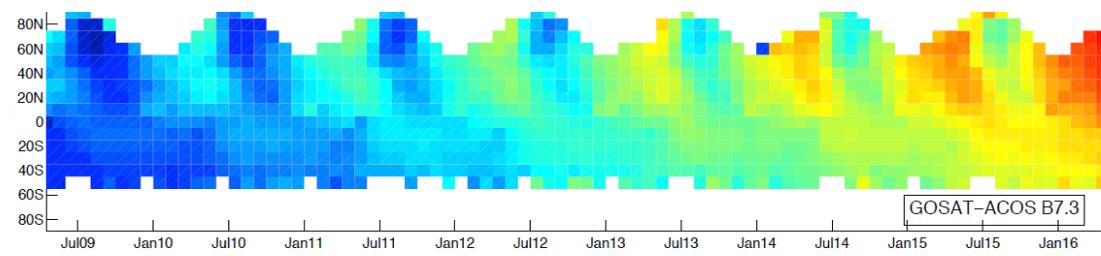




# ACOS/GOSAT B7.3, and OCO-2 v7 XCO<sub>2</sub>



June 2009 - present



TCCON and other standards have been used to cross validate OCO-2 and GOSAT X<sub>CO<sub>2</sub></sub> to extend the climate data record

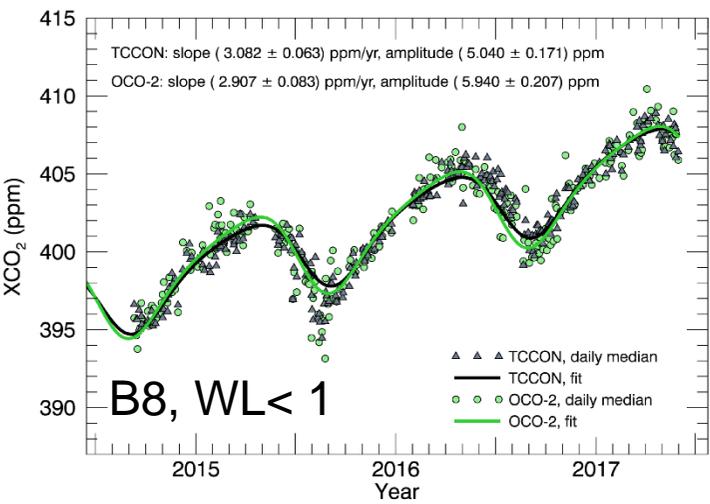
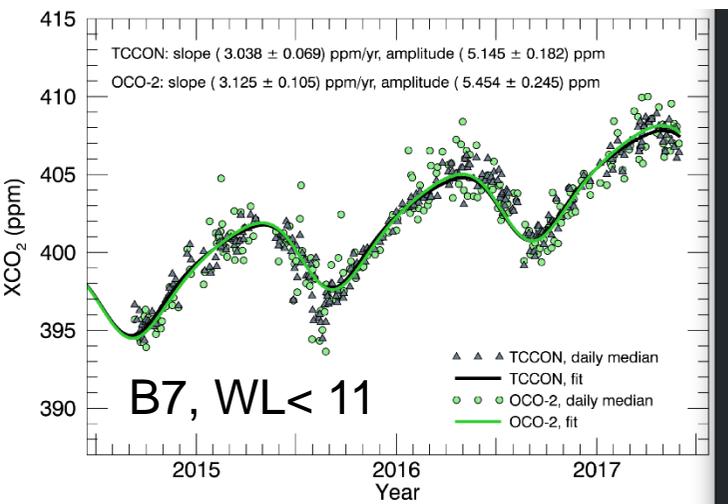
- The magnitude of differences between GOSAT-ACOS B7.3 and OCO2 v7r are within  $\pm 1$  ppm for overlap regions





# Validating Space-based Measurements against International Standards

- GOSAT and OCO-2 data were validated against the Total Column Carbon Observing Network (TCCON)
- TCCON is validated against the WMO standards profiles from in situ instruments on aircraft
- Other standards, including aircraft campaigns (HIPPO, ACT-America, Atom) also used
- These validation methods must be maintained and expanded to support future observations from LEO, GEO and HEO platforms



Time series of OCO-2 B7 (left) and B8 (right)  $X_{CO_2}$  with the Lamont TCCON  $X_{CO_2}$

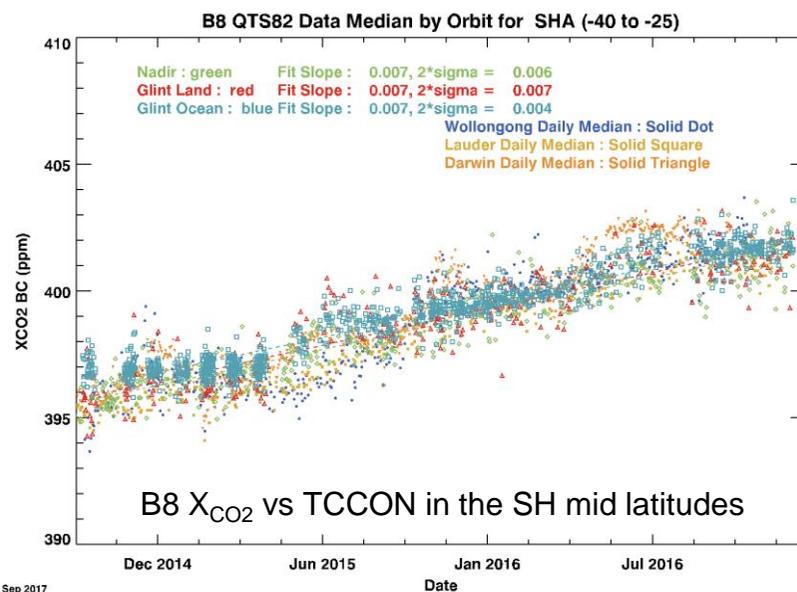
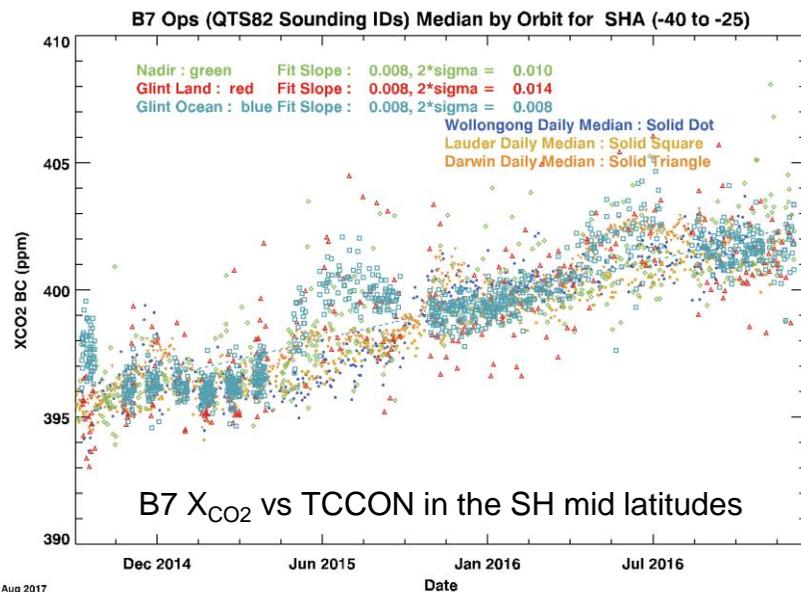
Lindqvist et al.





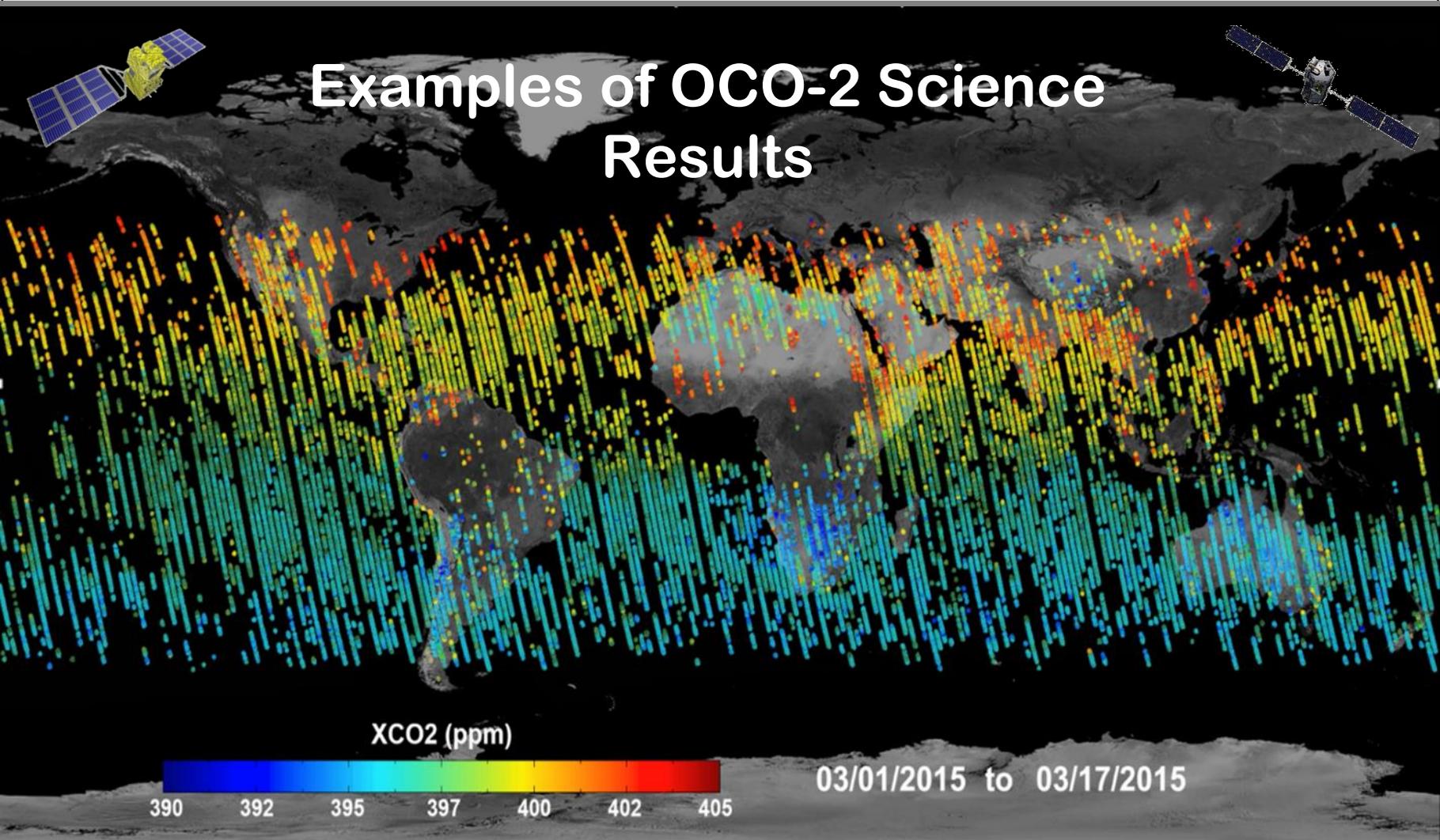
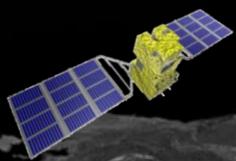
# Improved Remote Sensing Retrieval Algorithms are Needed

- Recent updates in the OCO-2  $X_{CO_2}$  retrieval algorithm have reduced both bias and scatter in the  $X_{CO_2}$  product
  - Version 8 (B8) updates include improved radiometric calibration, improved  $O_2$  cross sections, the addition of a stratospheric aerosol layer, a more realistic, non-Lambertian BRDF, updated cloud screening, and other smaller changes



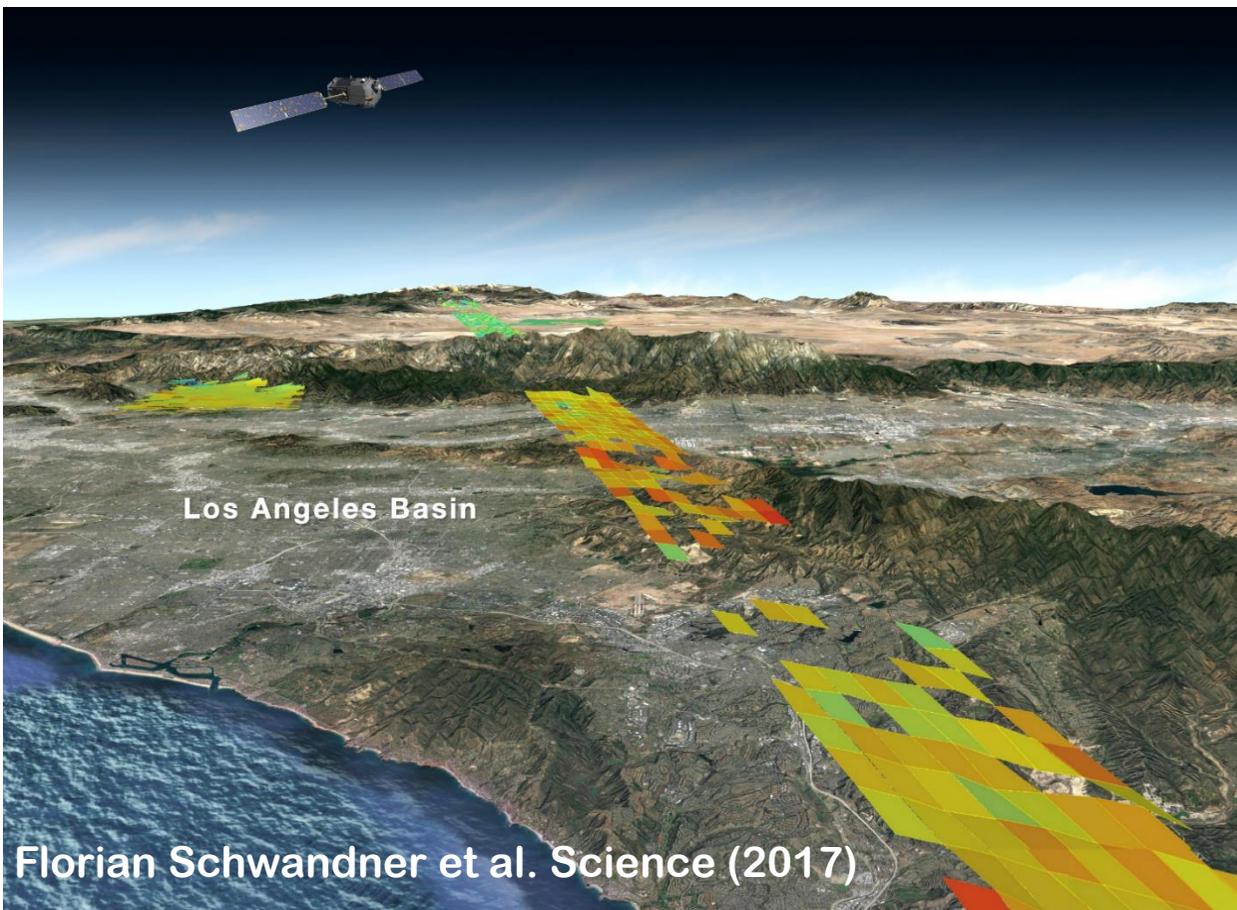


# Examples of OCO-2 Science Results

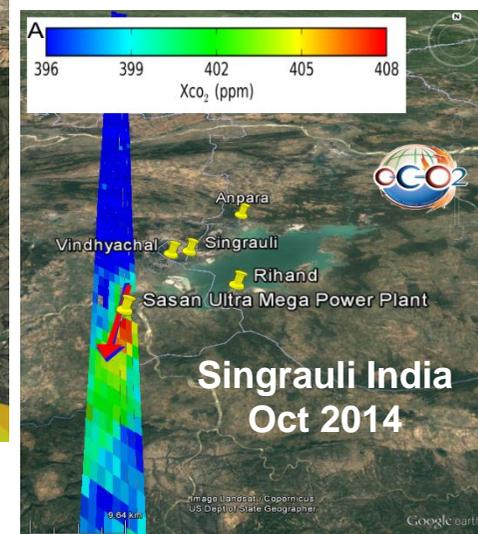
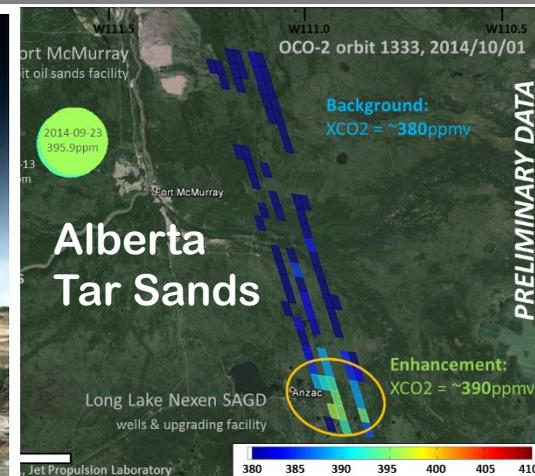




# Quantifying Localized Sources



High spatial resolution and full coverage are critical for quantifying localized sources



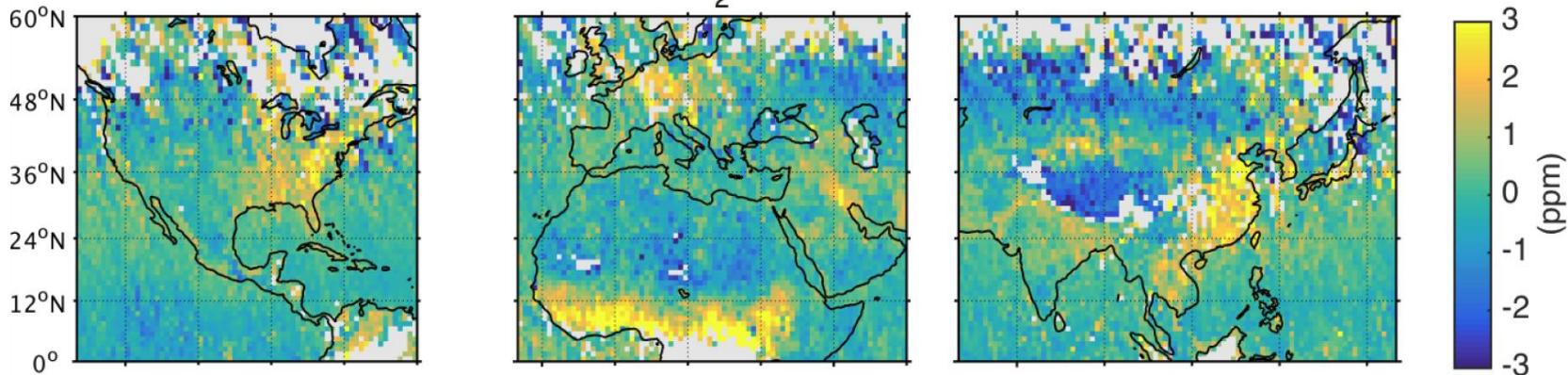
Nassar et al. (GRL 2017)



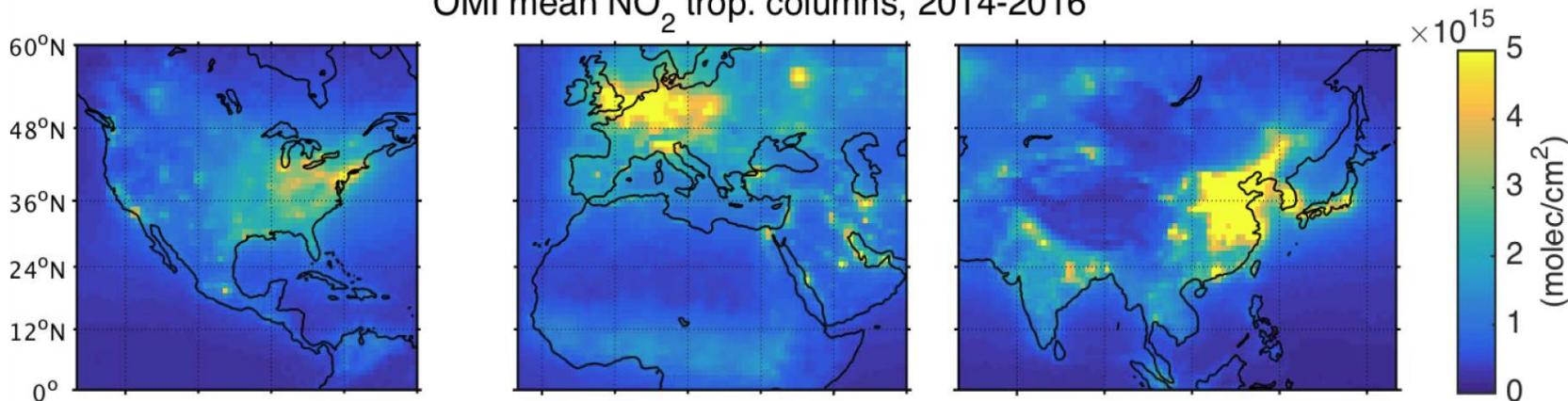


# Proxies, including NO<sub>2</sub> and CO are critical for Attributing Sources of CO<sub>2</sub> Emissions

OCO-2 mean XCO<sub>2</sub> anomalies, 2014-2016



OMI mean NO<sub>2</sub> trop. columns, 2014-2016

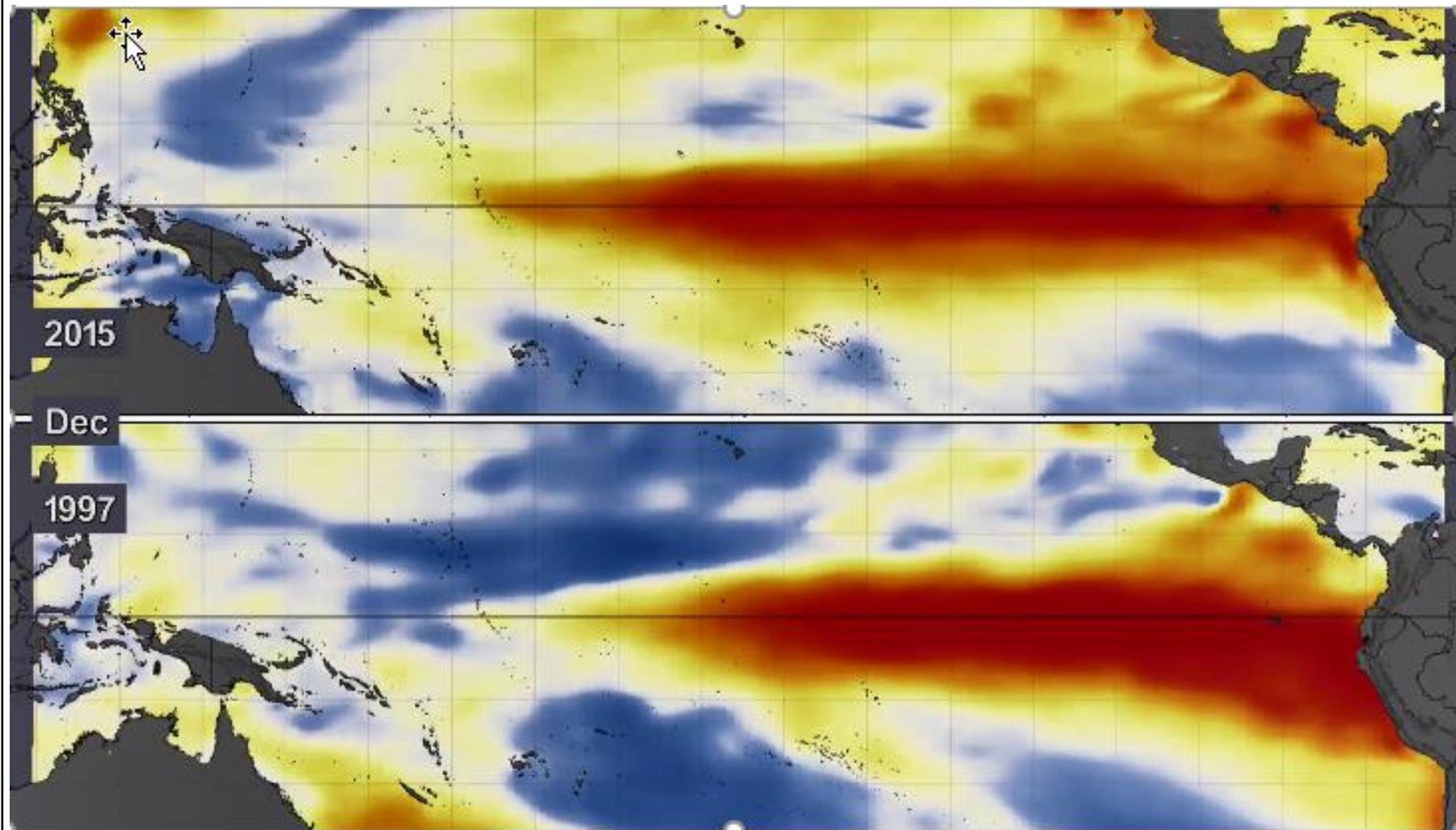


Janne Hakkarainen et al. GRL (2016)





# OCO-2 Observations of the 2015-2016 El Niño

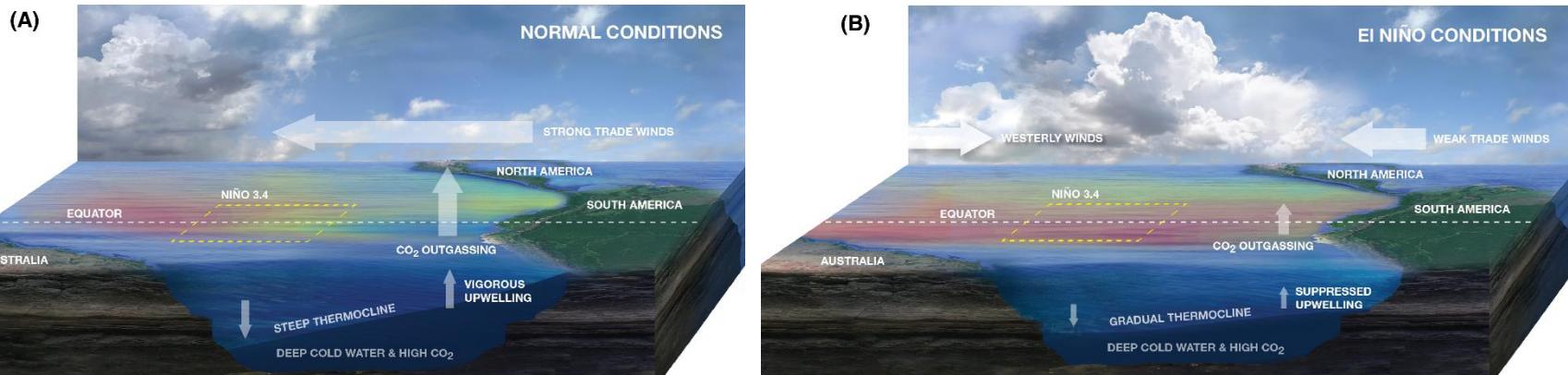




# How did the Carbon Cycle Respond to the 2015-2016 El Niño?

- OCO-2 was launched less than 9 months before the onset of the intense 2015-2016 El Niño
- During recent El Niños, the rate of CO<sub>2</sub> buildup has increased, but there are several unanswered questions:
  - What are the relative roles of the ocean and the atmosphere in the observed CO<sub>2</sub> increases?
  - What are the relative roles of drought, heat stress, and fire on the emissions of CO<sub>2</sub> from land during El Niño?
  - What are the implications of these changes for Climate/Carbon Cycle interactions as the climate warms?
- The unprecedented resolution and coverage provided by OCO-2 provides new ways to address these other questions about interactions between the climate and carbon cycle

# Carbon system in the Tropical Pacific

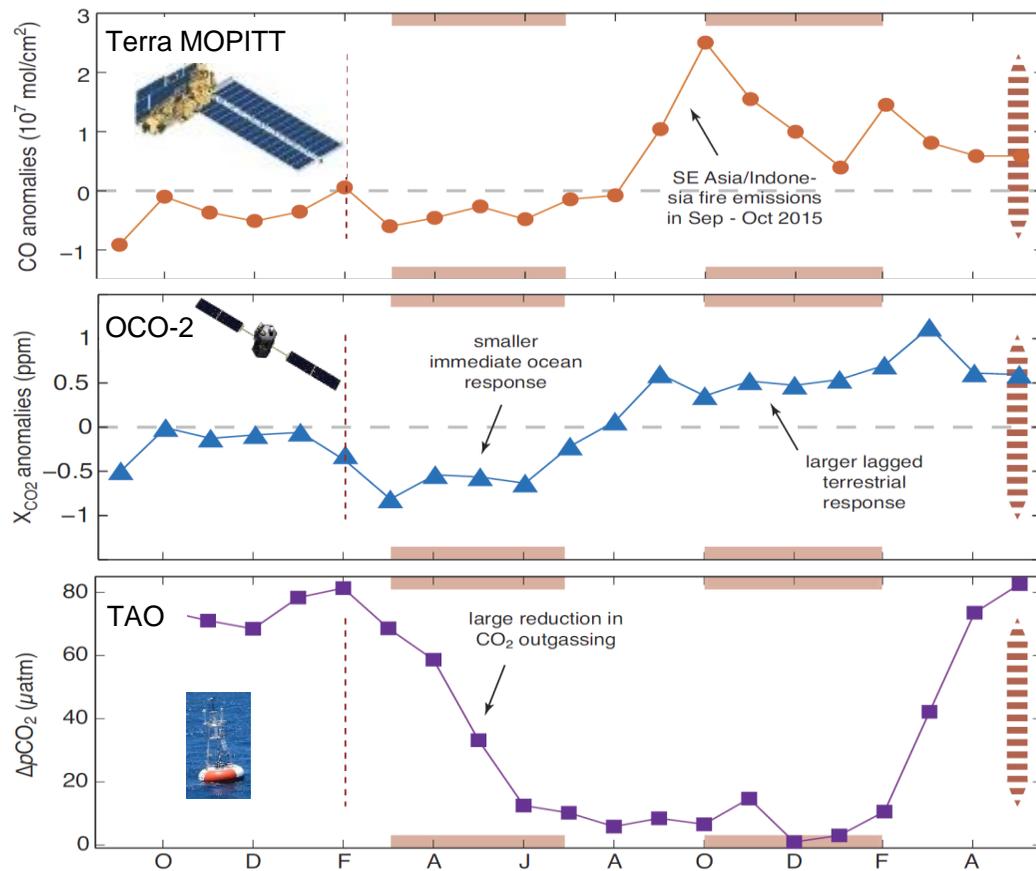
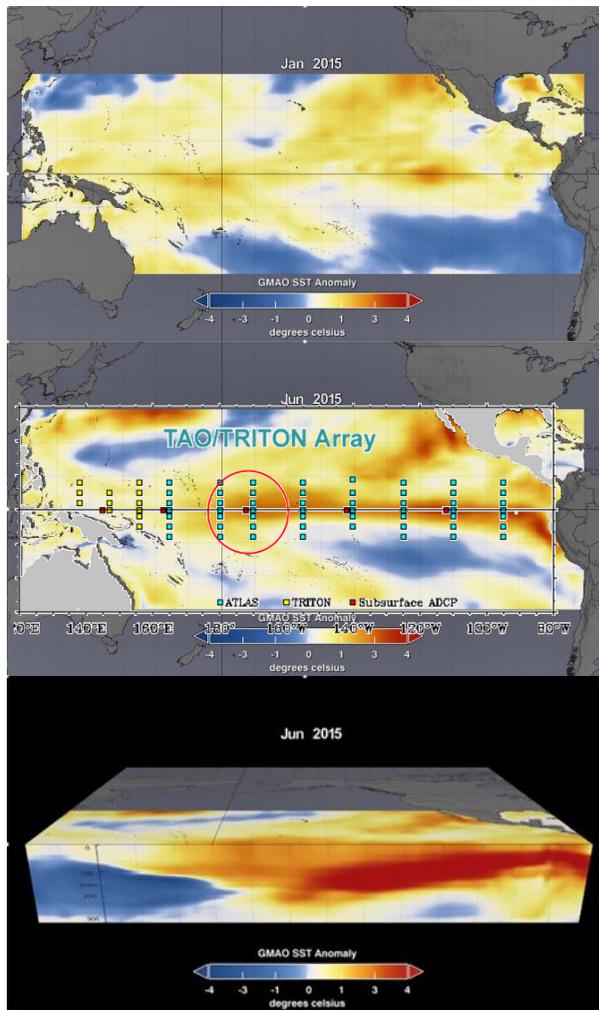


*Dijkstra* [2006]

- Normal conditions: upwelling of cold subsurface waters that have high potential  $p\text{CO}_2$  + inefficient biological pump → strong  $\text{CO}_2$  outgassing
- El Niño conditions: deepening of thermocline, reduction in upwelling, weakening of trade winds + more efficient biological pump → decreases  $\text{CO}_2$  outgassing by 40-60%



# 2015-2016 El Niño: Ocean Response

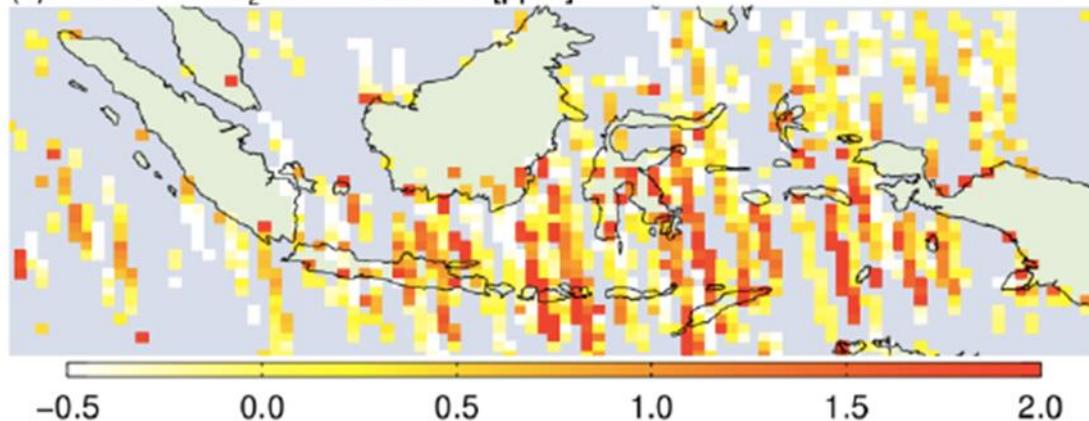


Abhishek Chatterjee et al. (2017)



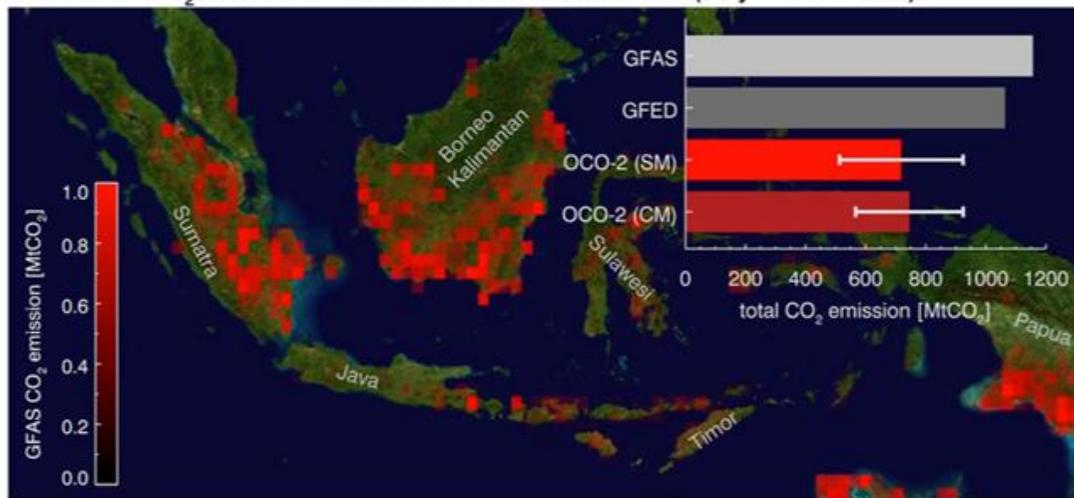
# 2015-2016 El Niño: Fires

(c) OCO-2 XCO<sub>2</sub> enhancements [ppm]



X<sub>CO<sub>2</sub></sub> enhancements over Indonesia observed by OCO-2 between July and November 2015.

Estimated CO<sub>2</sub> emission for the 2015 Indonesian fires (July - November)

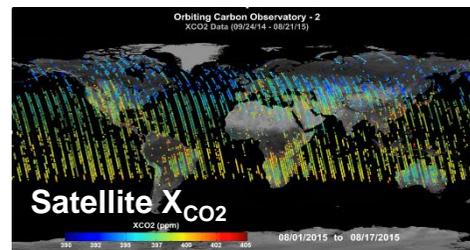
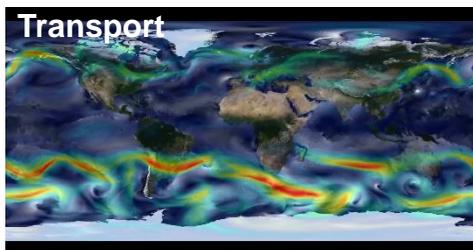


Fire emissions estimates from the GFAS and GFED inventories to emission estimates obtained from OCO-2 data, using two analysis approaches. The OCO-2 estimates are less than 70% as large as those in the inventories.

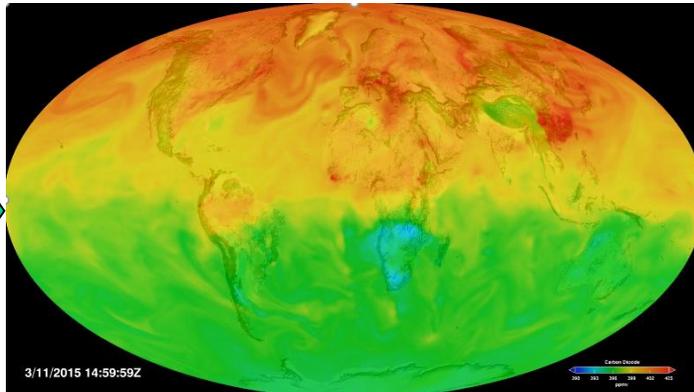
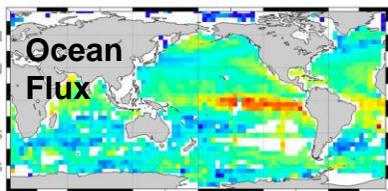
Jenns Heymann et al. (GRL, 2017)



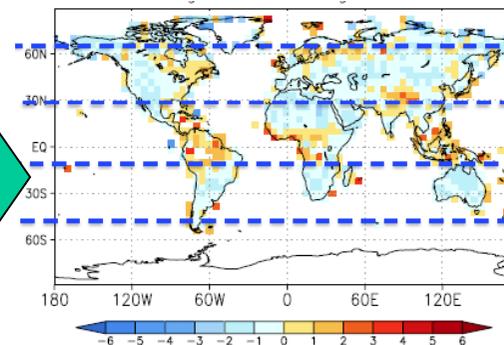
# “Top-Down” Flux Inversion Estimates



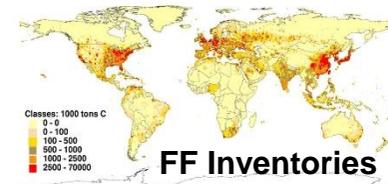
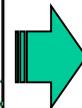
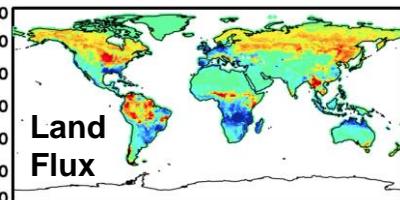
Prior Fluxes



Assimilation

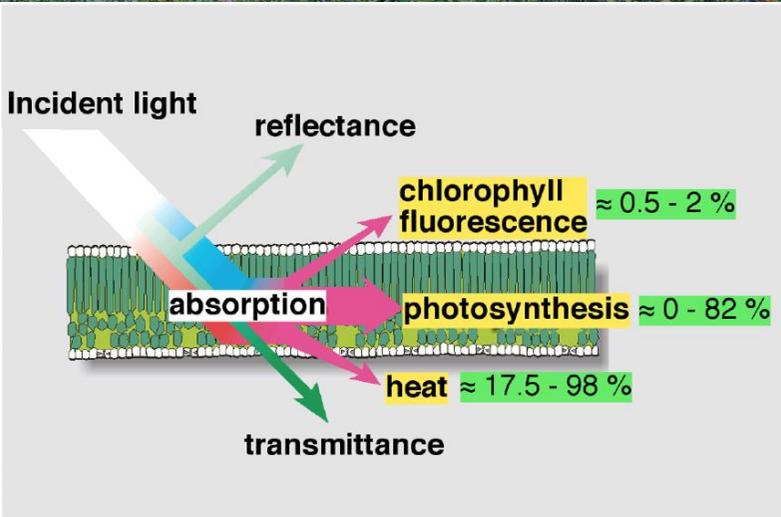
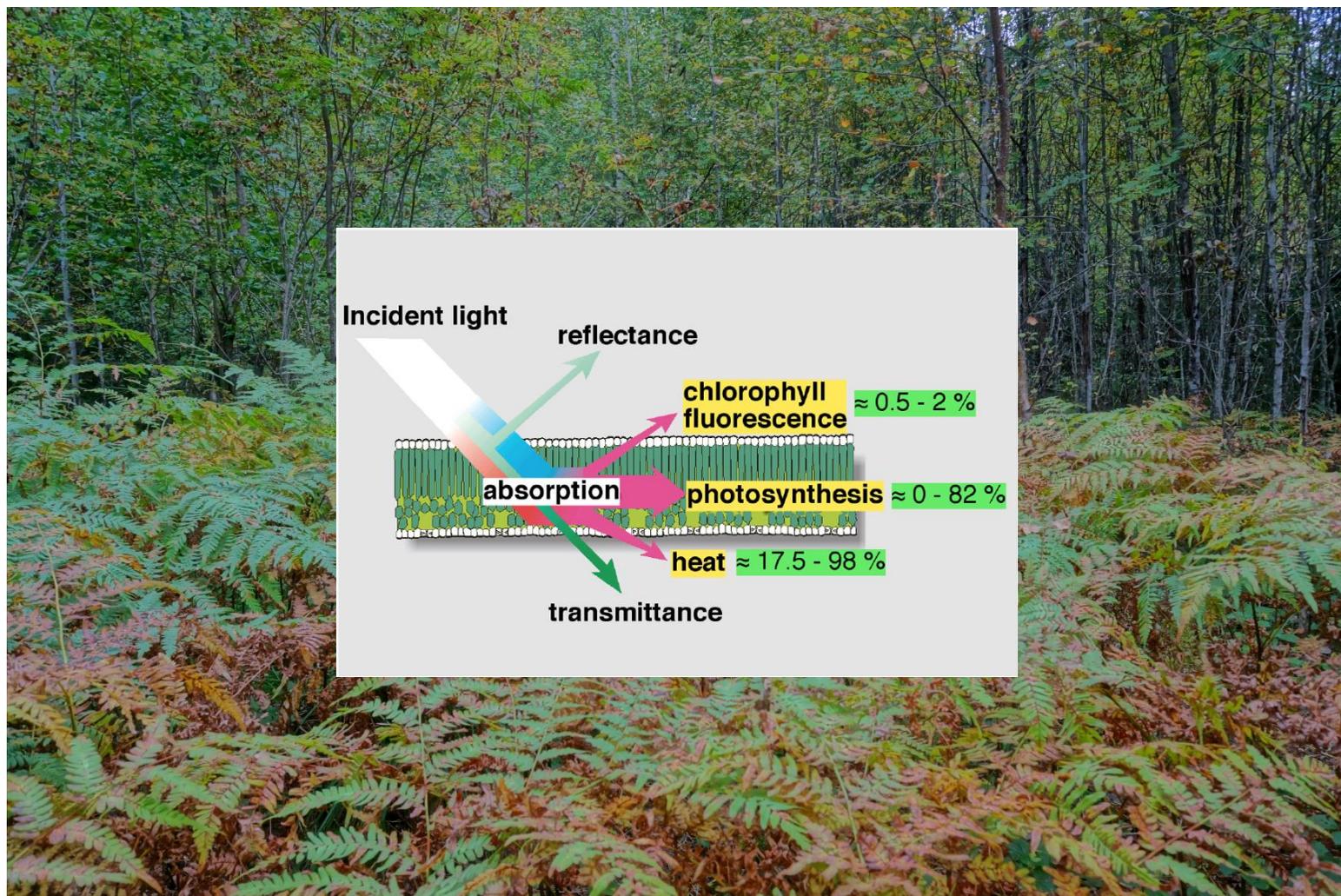


Optimized Fluxes



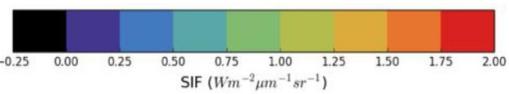
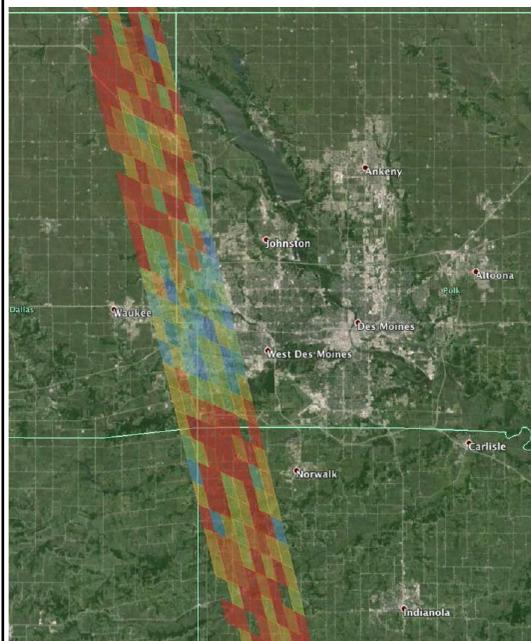


# Solar-Induced Chlorophyll Fluorescence (SIF)

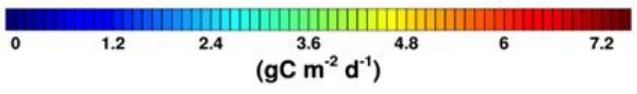
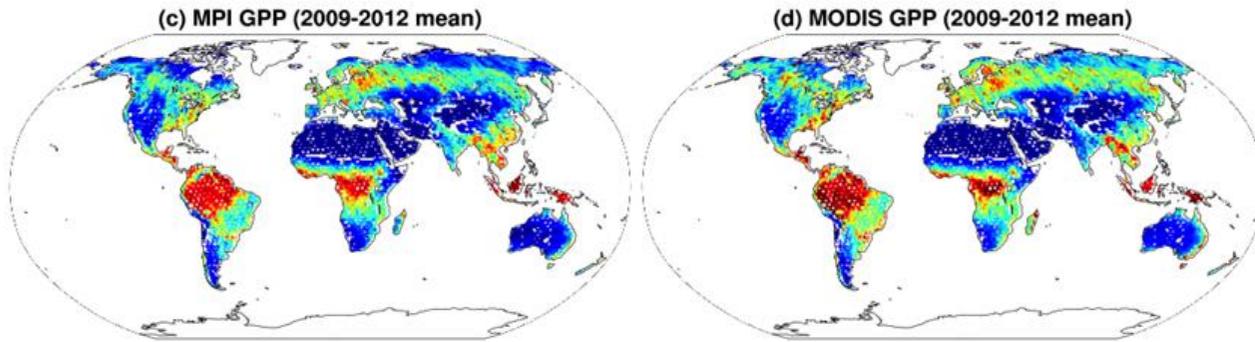
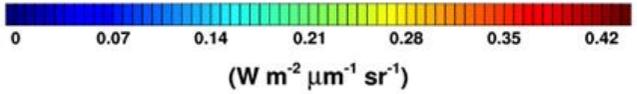
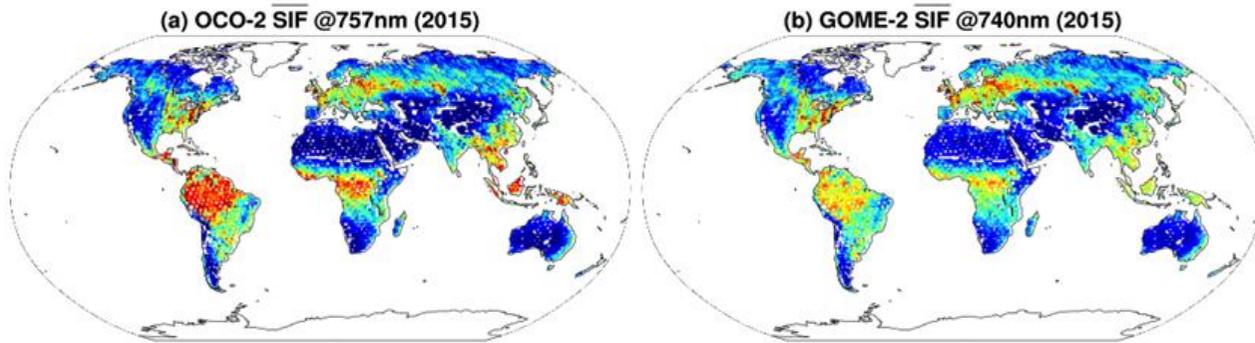




# Solar Induced Chlorophyll Fluorescence (SIF)



**OCO-2 SIF over  
Des Moines, Idaho**



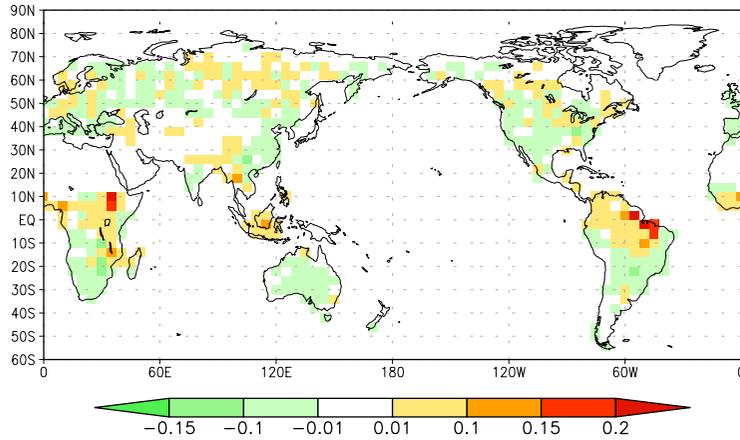
Ying Sun et al. (2017)



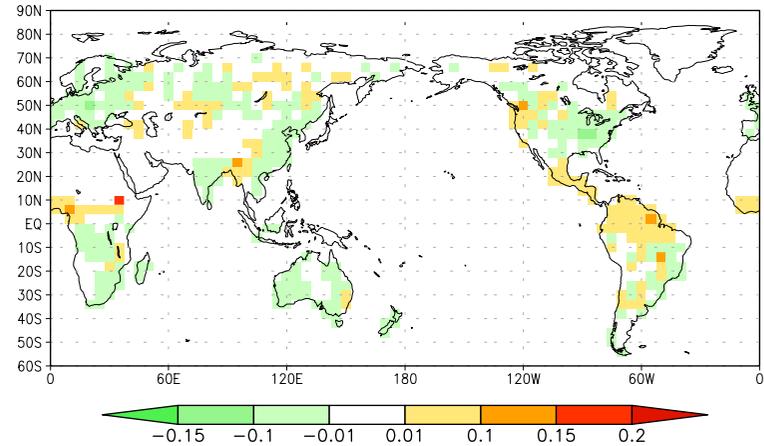


# 2015 El Niño and 2011 La Niña annual biosphere fluxes and their differences

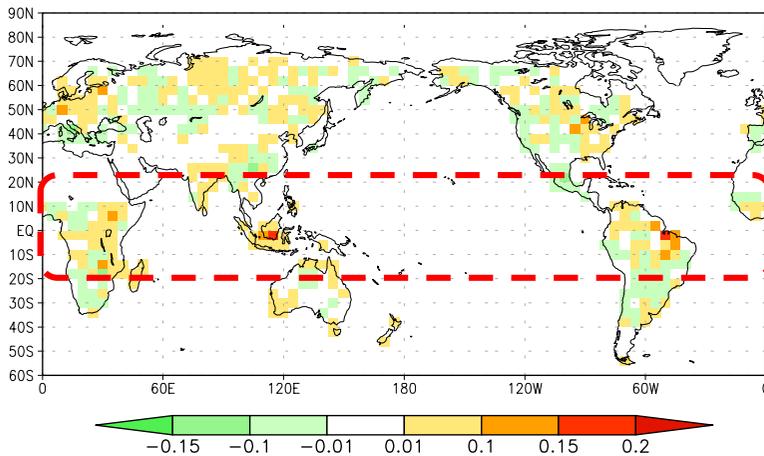
## 2015 (GtC/yr)



## 2011 (GtC/yr)



## 2015- 2011 (GtC/yr)



**Red: release CO<sub>2</sub> into atmosphere**

**Green: absorb CO<sub>2</sub> from atmosphere**

- The most significant impact of 2015 El Niño on biosphere carbon fluxes is the increase of CO<sub>2</sub> release from the tropics

Junjie Liu et al. (2017)



# 2015-2016 El Niño: 3 Continents, 3 Stories

Reduced GPP

Increased Respiration

Fire

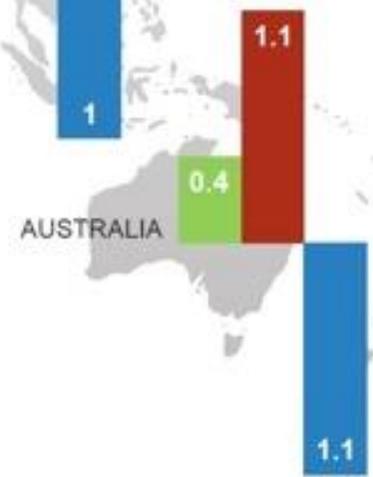
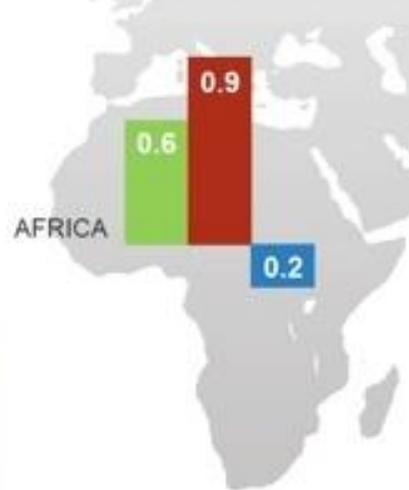
AMAZON

AFRICA

SOUTH EAST ASIA

AUSTRALIA

- NBE (2015-2011), GtC/yr
- T (2015-2011), K
- Precip (2015-2011), mm/day





# Key Results

- **OCO-2, with its unprecedented coverage over the tropical Pacific Ocean, provides a first-hand look at the space-time evolution of atmospheric CO<sub>2</sub> concentrations during the 2015-2016 El Niño**
- **Oceans do contribute to the ENSO CO<sub>2</sub> effect**
  - **Suppressed outgassing from the oceans happen early, followed by a larger (and lagged) response from the terrestrial component**
  - **The net increase in atmospheric CO<sub>2</sub> would be even larger in the absence of this ocean outgassing**
- **The tropical land biosphere response can vary from continent to continent, due to the competing effects of drought, heat stress and fire, all of which reduce CO<sub>2</sub> uptake**
  - **These processes may play increasingly important roles as the tropical climate evolves**



# Summary

- **Space-based remote sensing observations hold substantial promise for future long-term monitoring of greenhouse gases**
  - These data complement existing ground-based and aircraft based in situ data with increased coverage and sampling density
- **The GOSAT and OCO-2 missions are beginning to demonstrate these capabilities**
  - GOSAT and OCO-2 teams have pioneered methods for cross-calibrating measurements and cross-validating products
  - Their products have been combined to produce an 8-year record that is now being used in studies of the global carbon cycle
- **A new OCO-2 data product (B8) has been delivered to the Goddard Earth Science Data and Information Services Center (GES-DISC) for distribution to the science community:**  
<https://disc.gsfc.nasa.gov/datasets?page=1&source=OCO-2%20OCO%20SPECTROMETERS>

